# The Modification of Wind Turbine Performance by Statistically-Distinct Atmospheric Regimes

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Under Review in Wind Energy









# Wind Turbine Power Curve Relates Wind Speed at Hub to Power Output

Courtesy of Matt Aitken



Why can the observed data deviate from the manufacturer's predicted output?

# Deviations Can Be Created by Atmospheric Forcings

# Turbine power production influenced by related factors:

- wind shear across the rotor
- boundary layer turbulence
- stability
  - Elliot & Cadogan 1990
  - Hunter et al. 2001
  - Sumner and Masson 2006
  - Van den Berg 2008
  - Antoniou et al. 2009
  - Wagner et al. 2009
  - Wharton & Lundquist 2012

Day -> Convective, Turbulent, Low Shear

Night -> Stable, Non-Turbulent, High Shear



Rareshide et al. 2009

# Can Nacelle Wind Data Capture Atmospheric Dependencies?

- Many farms are data sparse with at most one 60m met tower
- But modern turbines typically span 40-120m!





Met Tower 1 Met Tower 2 Averaged Nacelle Substation

# We Use Nacelle Winds From Central North American Plains Wind Farm

- 134 1.5MW Turbines ullet
- 60m meteorological tower ullet
- Spring data used (Apr-May) •
- Strong diurnal cycle in U, T ullet





05 – 10 m/s 10

15 – 20 m/s 20+ m/s

– 15 m/s

# Spatial Analysis of Farm Production Illustrates Possible Wake Effects



Potentially waked turbines were flagged according to IEC 61400-12-1

- Wind sectors removed based on distance to obstruction
  - < 20D ≈ 1600m</pre>

#### Binning Metrics Included Stability, Bulk Layer Differences in Temperature



$$U_{2}=U_{1}\left(\frac{z_{2}}{z_{1}}\right)^{\alpha} R_{B}=\frac{g\cdot\Delta\theta_{V}\cdot\Delta z}{\overline{\theta_{V}}\cdot\left(\Delta u^{2}+\Delta v^{2}\right)}$$

ΔT regimes:

- Day exclusive (<-1)
- Day dominant (-1 to -0.55)
- Night dominant (-0.55 to 1)
- Night exclusive (>1)

# Bulk Layer Differences in Temperature Yield Largest Curve Separation (107kW)



Open circles indicate **not** statistically significant according to rank-sum test

# Results are Similar Using Stability Metric; More Universally Applicable?



# Monte Carlo Testing Shows Nacelle Wind Differences to be Significant

Adapted from Antoniou and Pedersen 1997



Assumed Systematic Bias

1000 run Monte Carlo
test at 10.25m/s bin
using rank-sum test,
1m/s random error

- 100% significant at
  0.01 level
- Avg. max power difference = 58kW

Simplistic Forecasting Application Demonstrates Potential Benefit

April-May data and correlations used to predict June farm power production – improved results!



# Conclusions

- Atmospheric binning of wind farm power data is possible with nacelle wind data
- ΔT differences are effective at binning data when the diurnal cycle is strong
- Improved power prediction is possible using condition based power curves

# Thank You!

#### Any questions?

